

Validation of the FALL3D model for the 2008 Chaitén eruption using field and satellite data

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ABSTRACT. The 2008 Chaitén Volcano eruption began on 2 May 2008 with an explosive phase that injected large amounts of tephra into the atmosphere. During the first week of the eruption, volcanic ash clouds were transported for hundreds of kilometres over Argentina by the prevailing westerly winds. Tephra deposition extended to the Atlantic Ocean and severely affected the Argentinean Patagonia. Impacts included air and water quality degradation, disruption of ground transportation systems and cancellation of flights at airports more than 1,500 km apart. We use the FALL3D tephra transport model coupled with the Weather Research and Forecasting-Advanced Research Weather (WRF-ARW) meteorological model to simulate tephra fall from the 2-9 May 2008 eruptive period. Our hindcast results are in good agreement with satellite imagery and reproduce ground deposit observations. Key aspects of our analysis, not considered during syn-eruptive forecasts, are the re-initialization of each simulation with actualized meteorological forecast cycles and better constrained model inputs including column heights (inferred from reanalysis of GOES-10 imagery and nearby atmospheric soundings) and granulometric data obtained from field campaigns. This study shows the potential of coupling WRF/ARW and FALL3D models for short-term forecast of volcanic ash clouds. Our results highlight that, in order to improve forecasting of ash cloud dispersion and tephra deposition, it is essential to implement an operational observation system to measure temporal variations of column height and granulometric characteristics of tephra particles in nearly real-time, at proximal as well as distal locations.

Keywords: Chaitén eruption, FALL3D model, Ash dispersion, Ground deposition, Granulometry, Risk management.

RESUMEN. Validación del modelo FALL3D para la erupción del Chaitén en 2008 usando datos satelitales y de campo. La erupción del volcán Chaitén se inició el 2 de Mayo de 2008 con una fase explosiva que inyectó grandes cantidades de tefra a la atmósfera. Durante la primera semana de erupción, se dispersaron nubes volcánicas por cientos de kilómetros sobre Argentina, siguiendo los vientos dominantes del oeste. El depósito de tefra se extendió hasta el océano Atlántico y afectó severamente a la Patagonia. Los impactos incluyen degradación de la calidad del aire y el agua, interrupción del sistema de transporte terrestre y la cancelación de vuelos incluso en aeropuertos a 1.500 km del volcán. Aquí se usó el modelo FALL3D de transporte y depósito de tefra con el modelo meteorológico Weather Research and Forecasting-Advanced Research Weather (WRF-ARW) para simular el período eruptivo del 2 al 9 de mayo de 2008. Los resultados obtenidos del pronóstico retrospectivo tienen una buena concordancia con las imágenes satelitales y reprodujeron las observaciones de depósito en superficie. Los aspectos claves de este análisis, no considerado durante los pronósticos contemporáneos, son la reinicialización de cada simulación con ciclos de pronósticos actualizados y condiciones iniciales del modelo más ajustadas, incluyendo alturas de columna eruptiva (inferidas a través del análisis de imágenes satelitales GOES-10 y radiosondeos cercanos) y datos granulométricos obtenidos a partir de campañas de campo. Este estudio muestra el gran potencial que tiene el acoplar el modelo WRF/ARW con el FALL3D para generar pronósticos a corto plazo de la nube volcánica. Los resultados presentados revelan que, para mejorar los pronósticos de dispersión y depósito de tefra, es esencial implementar un sistema de observación operativo con el fin de medir las variaciones temporales de la altura de columna y las características granulométricas de las partículas de tefra casi en tiempo real, tanto en lugares próximos como lejanos al volcán.

Palabras clave: Erupción del Chaitén, Modelo FALL3D, Dispersión de ceniza, Depósito en superficie, Granulometría, Manejo del riesgo.

1. Introduction

The May 2008 explosive eruption of Chaitén Volcano in southern Chile (42.83°S, 72.65°W, 1,122 m a.m.s.l.) was one of the most powerful eruptions in South America during the last century. The Chaitén Volcano, located ten kilometers north of Chaitén town, a small village on the Gulf of Corcovado, comprises a rhyolitic lava dome emplaced in a 2.5 km diameter caldera (Naranjo and Stern, 2004; Lara, 2009; Watt *et al.*, 2009). Late on 1 May and early on 2 May 2008 around 04:00 local time (LT) the volcano reawakened after ~36 hours of increased seismic activity measured by the Chilean Southern Andean Volcano Observatory (OVDAS) of the Servicio Nacional de Geología y Minería (SERNAGEOMIN). The subsequent explosive stage of eruption comprised four main phases (Durant *et al.*, 2012), categorized by eruption column altitude, persistence and mass discharge: 2 May (phase 1), 3-5 May (phase 2), 6 May (phase 3) and 8 May onwards (phase 4). Ash clouds from the eruption had serious impacts on aviation, agriculture and air quality in the region.

Folch *et al.* (2008) used the FALL3D dispersion and deposition model (Costa *et al.*, 2006; Folch *et al.*, 2009) to test the operational capacity to forecast ash cloud trajectories and tephra fallout during the first week of the Chaitén eruption. The model was driven by the Weather Research and Forecasting-Advanced Research Weather (WRF/ARW) mesoscale meteorological

model and semi-quantitative observational inputs based on the first eruption reports. Although near real-time forecasts are extremely valuable, uncertainties in model outputs are typically large because key volcanological inputs are poorly constrained during an eruption. Data collected during an eruption provides an exceptional opportunity to test and validate volcanic ash transport and dispersion models (VATDM).

Here we perform a hindcast simulation for the period 2-9 May 2008 using WRF/ARW forecasts and a re-initialization of the FALL3D model every 48 hours. This strategy implies the initialization of a FALL3D run using the airborne ash concentration and deposit thickness from the previous run, and the updated WRF/ARW 72-hour forecasts. Furthermore, we use a Total Grain Size Distribution (TGSD) derived from Durant *et al.* (2012) and column heights that are a blend of those published in articles (Folch *et al.*, 2008; Carn *et al.*, 2009; Lara, 2009; Watt *et al.*, 2009; Alfano *et al.*, 2011a; Durant *et al.*, 2012) and those obtained from estimations of cloud top temperatures derived from GOES-10 satellite imagery analysis and nearby atmospheric soundings. In this sense, this work can be viewed as an improvement of the results presented in Folch *et al.* (2008) which used limited observational constraints and did not re-initialize each partial hindcast run.

In this paper we briefly summarize the eruption chronology, review the configuration of the WRF-

ARW and FALL3D models, and compare new simulation results with satellite imagery, ground deposit measurements, and observations of visibility reduction by airborne ash reported at some ground-based meteorological stations.

2. Chronology of the May 2008 Chaitén Eruption

Pre-eruptive seismicity, as measured ~300 km from the volcano, started on 30 April 2008. From 1-2 May 2008 the OVDAS seismic network registered earthquakes ranging between Mw 3.2-5.2. However, the deployment of the OVDAS seismic stations far away from the source, and the fact that Chaitén had been dormant for a long period of time (the volcano was unmonitored), caused uncertainty with regard to the location of the seismic activity. A brief chronology of the eruption during the first week of activity is as follows (additional information is given in Table 1 and in Major and Lara, 2013, this volume):

- The eruption began late on 1 May 23:38 LT with minor ash emissions and a violent explosion (phase 1) occurring at around 08:00 UTC (LT=UTC-4) on 2 May. The explosion lofted an eruption column approximately 20 km above mean sea level (a.m.s.l.) according to eyewitnesses (Lara, 2009). Although the eruption plume was detected from GOES-10 IR images, the ash-cloud top was estimated at only about 12 km a.m.s.l. (Carn *et al.*, 2009). During the day there were two distinct ash cloud trajectories: a low level cloud with a trajectory directed SSE; and a high altitude cloud deflected NNW in association with anticyclonic wind circulation (anticlockwise sense in the southern hemisphere). Volcanic ash fallout severely affected the cities of Futaleufú (Chile, 70 km from Chaitén) and Esquel (Argentina, 110 km from Chaitén) (Fig. 1); minor ash deposition also occurred across Argentinean Patagonia up to the Atlantic Ocean.
- On 3 May seismicity declined abruptly (Lara, 2009), the eruption column had an estimated height of 10 km or less (Watt *et al.*, 2009; Carn *et al.*, 2009; Alfano *et al.*, 2011a) and the ash cloud was dispersed SE. During the afternoon of 4 and 5 May the volcanic cloud dispersed eastward. This period (3-5 May) comprises phase 2 of the eruption.
- At around 12:00 UTC on 6 May energetic explosive activity elevated the eruption column up to

30 km according to eyewitnesses (Folch *et al.*, 2008; Watt *et al.*, 2009; Carn *et al.*, 2009), but only to 20 km according to satellite images (Carn *et al.*, 2009; Alfano *et al.*, 2011a). This reinvigorated activity marked the beginning of phase 3. A second burst with lower intensity occurred at around 19:00 UTC according to GOES-10 imagery. Both during and after these bursts in column height ash was dispersed NE.

- By 8-9 May, the eruption column had a height of about 8 km a.m.s.l. (SERNAGEOMIN, 2008¹) except for a short-duration burst at 03:30 UTC on 8 May, which rose to 20-22 km (Carn *et al.*, 2009). This waning explosive activity signaled the beginning of phase 4. During this period, ash was dispersed mainly NE, but shifted to a more ESE trajectory on 9 May. The Cloud-Aerosol Lidar with Orthogonal Polarization (CALIOP) instrument detected volcanic aerosols from a minor column burst to about 13 km (Carn *et al.*, 2009). During 8 May the presence of ash between 3 and 10 km altitude was reported at Buenos Aires (Folch *et al.*, 2008) (Fig. 1). After this last burst, explosive eruptive activity diminished significantly.

3. Modelling strategy

3.1. Meteorological modeling using WRF/ARW

Meteorological fields were derived using the numerical weather prediction model Weather Research and Forecasting-Advanced Research Weather (WRF/ARW) (Michalakes *et al.*, 2005). We ran the WRF/ARW numerical model every 72 hours using 6-hour initial and boundary conditions from the 12:00 UTC forecast cycle of the 1 degree Global Forecast System (GFS) produced by the National Centers for Environmental Prediction (NCEP). The GFS is a global meteorological model that runs four times a day, which is initialized with an analysis updated by the assimilation of meteorological data from the Global Telecommunications System (GTS).

The WRF-ARW meteorological model domain spanned from 52°S-32°S and 77°W-53°W (Fig. 1), with horizontal resolution of 12 km (~0.11°) and 38 vertical pressure layers. Forecasts were generated out to 72 hours at 3-hour increments. The physical parameterizations used in the WRF-ARW model are similar to those employed by Folch *et al.* (2008). These include the single-moment 3-class microphysics

¹ SERNAGEOMIN. 2008. Erupción del volcán Chaitén. Servicio Nacional de Geología y Minería (SERNAGEOMIN), Quinto Informe Técnico (Inédito), 09 de mayo de 2008: 2 p.

TABLE 1. ERUPTION CHRONOLOGY FOR THE MAY 2008 ERUPTION OF CHAITÉN VOLCANO, CHILE (REPRODUCED FROM DURANT *ET AL.*, 2012).

Phase	Date	Time (UTC)	Observation	Cloud height (location)	Measurement source	Reference
1	2 May 08	08:00-14:00 Morning	Initial explosive ash column Early column activity Stratospheric cloud height	>21 km (Chaitén Volcano) 10.7-16.8 km 12 km	Visual observation (PIREP) Visual observation (SGVP) GOES imagery	(Carn <i>et al.</i> , 2009; Folch <i>et al.</i> , 2008) (Folch <i>et al.</i> , 2008) (Carn <i>et al.</i> , 2009)
2	3 May 2008 3-5 May 2008 3-4 May 2008	18:15 - -	Explosive ash column Sustained explosive ash emission Fine volcanic ash and/or ice crystals	17.4-19.6 km <10 km (Chaitén Volcano) ~12 km (30°S)	Visual observation (clinometer) CALIOP / OMI -	G. Villarosa (Watt <i>et al.</i> , 2009) (Carn <i>et al.</i> , 2009)
3	6 May 2008 6 May 2008 7 May 2008 7 May 2008 7 May 2010	12:00* 13:30* 20:00:00 - -	Initial explosive ash column Initial explosive ash column Increase in eruption intensity Eruption column Ash / ice-coated ash cloud	30 km (Chaitén Volcano) 30 km (Chaitén Volcano) - 7-10 km ~16 km (41°-42°S)	- Visual observation (ONEMI) - CALIOP -	(Carn <i>et al.</i> , 2009) (Folch <i>et al.</i> , 2008) (Folch <i>et al.</i> , 2008) (Folch <i>et al.</i> , 2008) (Thomason and Pitts, 2008)
4	8 May 2008 8 May 2008 9 May 2008	03:30 - -	Initial explosive ash eruption Airborne ash Volcanic aerosol	20-22 km (Chaitén) 3-10 km (Buenos Aires) 13 km	GOES imagery - CALIOP	(Carn <i>et al.</i> , 2009) (Folch <i>et al.</i> , 2008) (Carn <i>et al.</i> , 2009)

CALIOP Cloud-Aerosol Lidar with Orthogonal Polarization (on Cloud-Aerosol Lidar and Infrared Pathfinder Satellite Observations platform).

GOES Geostationary Operational Environmental Satellite

OMI Ozone Monitoring Instrument

ONEMI Oficina Nacional de Emergencia del Ministerio del Interior (National Office of Emergency of the Interior Ministry, Chile)

PIREP Pilot report

SGVP Smithsonian Global Volcanism Program

* These reports conflict on the time of onset of the initial activity of Phase 3

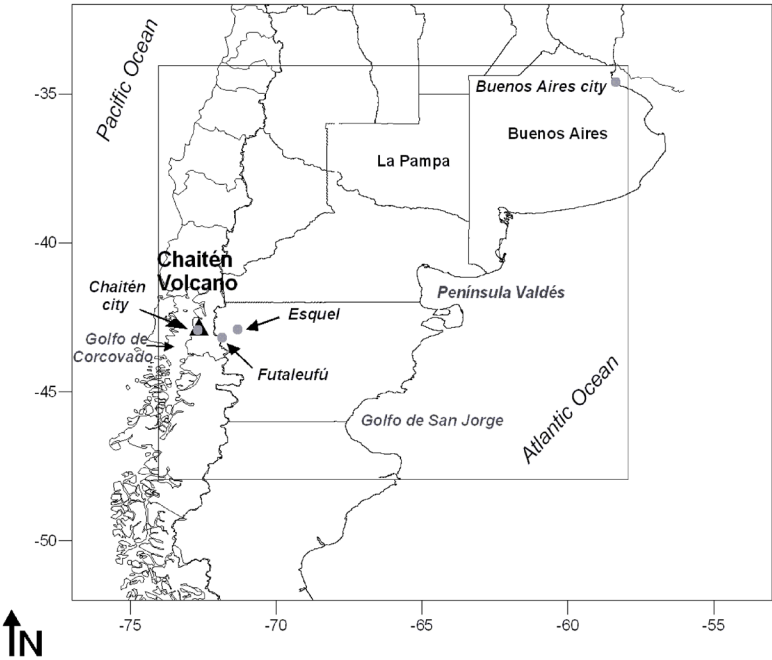


FIG. 1. Weather Research and Forecasting-Advanced Research Weather (WRF-ARW) model domain, centred at 42.5°S, 65°W (large square) and FALL3D model domain (inner square). The black triangle indicates the location of the Chaitén Volcano. The cities of Esquel, Futaleufú, Chaitén and Buenos Aires are indicated (grey dots).

scheme (Hong *et al.*, 2004), the Kain-Fritsch cumulus scheme (Kain and Fritsch, 1990), the Noah Land-Surface model (Skamarock *et al.*, 2008), the Yonsei University Planetary Boundary Layer (PBL) scheme (Hong *et al.*, 2006), the Rapid Radiative Transfer Model (RRTM) long wave radiative model (Mlawer *et al.*, 1997), and a short-wave radiative model by Dudhia (1989). These parameterizations are expressions of processes from scales that are not explicitly solved by the WRF-ARW model. They are included owing to their strong influences on the meteorological fields.

3.2. Volcanic Ash Transport and Deposition modelling

We used the FALL3D Eulerian model (Costa *et al.*, 2006; Folch *et al.*, 2009) to simulate tephra dispersion and deposition. This model uses 4D (time and space) meteorological fields and volcanological inputs to produce temporal predictions of airborne ash concentration, ash cloud mass loading, and tephra fallout load. The FALL3D computational domain considered here (Fig. 1) has a 0.06° horizontal resolution (≈6 km along a meridian) and vertical resolutions of 0.5 km below and 1 km above the Planetary Boundary Layer (PBL). Volcanological inputs required by the model include column height, TGSD, Mass Eruption Rate

(MER), and vertical distribution of mass. Eruption column heights used in the simulation (Table 2) were obtained from Folch *et al.* (2008), Watt *et al.*

TABLE 2. COLUMN HEIGHTS (IN M ABOVE MEAN SEALEVEL) USED DURING THE HINDCAST SIMULATIONS (FROM 2 MAY 08:00 UTC TO 9 MAY 00:00 UTC).

Date	Hour (UTC)	Height (m)
5/2/2008	8:00	13,000
5/2/2008	14:00	11,000
5/2/2008	16:00	10,000
5/2/2008	17:00	8,000
5/2/2008	19:00	10,000
5/2/2008	20:00	8,000
5/4/2008	12:00	14,000
5/5/2008	17:00	9,000
5/6/2008	13:00	22,000
5/6/2008	15:00	8,000
5/6/2008	19:00	10,000
5/7/2008	1:00	6,000
5/8/2008	5:00	12,000
5/8/2008	6:00	8,000

(2009), Lara (2009), Carn *et al.* (2009) and Durant *et al.* (2012). They are based on eyewitnesses and satellite imagery and were refined during the major eruptive pulses using GOES-10 IR images available in ~15 minutes period.

TGSD was estimated from field data presented in Durant *et al.* (2012). We consider two different granulometries for the major eruptive phases, one during the 2-5 May period and the other during 6-9 May. The discretization of both TGSDs assumes 11 bins ranging from 1Φ (0.5 mm) to 11Φ (0.5 μm), and a linear dependency of particle density with diameter, with values of 970 and 1,226 kg/m^3 for the two end-members (Watt *et al.*, 2009). Particle sphericity, which is the ratio of the surface area of a sphere having a diameter equivalent to the particle diameter to the surface area of the particle, is assumed constant and equal to a standard value of 0.9 (Alfano *et al.*, 2011b). The resulting histograms of particle grain size distribution are shown in figure 2.

In order to quantify the mass eruption rate and mass distribution in the eruptive clouds we used the 1D radially averaged Buoyant Plume Theory (BPT) model (Bursik, 2001; Carazzo *et al.*, 2008). This source term model solves for MER and vertical distribution of mass given the column height and plume mixture conditions at the vent. We assumed a mixture exit velocity of 200 m/s and a temperature of 850°C.

The FALL3D model was configured with the Ganser (1993) terminal fall velocity model, and it

computed the horizontal diffusion as in the CMAQ model (Byun and Ching, 1999). For simplicity, ash aggregation effects were not considered. Numerical weather prediction error grows as lapse time increases. Therefore, the FALL3D model was restarted every 48 hours to include updated 72 hourly WRF/ARW forecasts so that the model maintained memory of the previous airborne ash concentration and deposit thickness. In each partial run, the meteorological driver is shifted by 12 hours to allow sufficient spin-up. The final simulations are obtained by concatenating 48 hours forecasts from 1 May at 12:00 UTC to 9 May at 00:00 UTC.

4. Results and Model Validation

4.1. Comparison with Satellite Retrievals

Passive remote sensing uses energy emitted by the sun or the surface of Earth to infer the presence of gases and particles in the atmosphere. Using a radiative transfer model and information on the spectral refractive indices of target gases or particles (*e.g.*, water, ice, silicate ash, and SO_2), retrieval schemes have been devised to determine the mass loading of gases and particles and a measure of their optical depth. Ash mass loadings and an estimate of the effective particle size are routinely retrieved through exploitation of ‘reverse absorption’ in the thermal infrared (TIR) between wavelengths of 8-12 μm (Prata, 1989). When satellite radiance data are calibrated

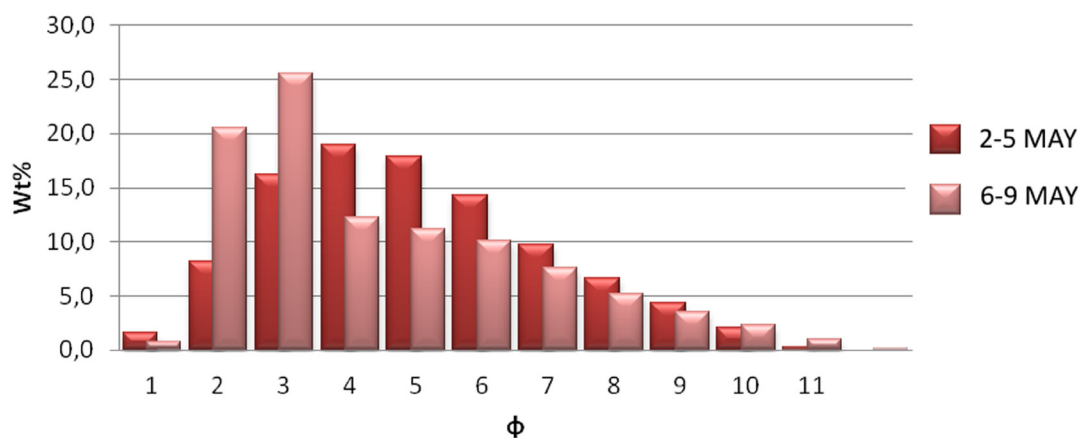


FIG. 2. Total Grain Size Distributions (TGSDs) used in the simulations of ash dispersal during the 2-5 May 2008 (red) and 6-9 May 2008 (pink) explosive periods of the Chaitén eruption. Granulometries have been estimated after Durant *et al.* (2012) and are based on field measurements done at distances >80 km during the first week of the eruption.

and converted to temperature, a colder volcanic ash cloud over the warmer surface of the Earth satisfies the following condition:

$$BTD = T_{11} - T_{12} < 0 \text{ K},$$

where BTD is the brightness temperature difference, and T_{11} and T_{12} are brightness temperatures (Kelvin) at 11 and 12 μm , respectively. This algorithm is also known as the split window method, we used this technique with MODIS sensor images and selected a threshold value below -0.2 K, using a color enhancement for the negative values, to indicate the presence of ash.

It is well known that this technique has limitations (Prata *et al.*, 2001) related to uncertainty in the refractive index of the cloud particles, particle shape, and the presence of meteorological clouds. However, in most of instances this technique discriminates water clouds from ash clouds. Thus, this technique has been used to compare the observed location of the ash cloud with the simulated location.

In order to compare model results against BTD imagery we use the cloud column mass (vertical integration of tephra mass, in t/km^2). According to the BTD image, on 2 May at 13:45 UTC the ash cloud was dispersed SE before it split in two branches, one continuing SE and the other NE. The model simulated this split trajectory reasonably well (Fig. 3a), but it predicted a smaller extension for the SE branch and a larger extension for the NE branch. In contrast, the more distal BTD signal (light blue contour in Fig. 3a) was not reproduced by the model. This could be explained by errors in the model source term (*e.g.*, the occurrence of initial light eruption pulses not introduced in the model inputs).

During 2 May the plume was mainly directed to NE. The WRF-ARW forecast shows that the 500 hPa (~ 5.5 km) wind field had an anticyclonic (counter clockwise) rotation around the source region consistent with the NE dispersal indicated by the BTD image. Simultaneously, the 850 hPa (~ 1.5 km) wind field over northern Patagonia blew at lower speed toward the SE in accordance with the SE branch of the ash cloud (Fig. 4). Late on 2 May the wind rotation over Patagonia produced a shift of the volcanic plume to the SE and that trajectory lasted until late on 4 May.

On 3 May the comparison between the modeled column mass and the BTD image at around 15:00

UTC shows a good agreement with cloud dispersion directed SE. The deflection of the plume to the NW at around 60°W is related to the wind shift mentioned above. The presence of clouds on 4 May made it difficult to detect the ash plume using the BTD algorithm, but the FALL3D model results indicate a SE dispersion. On 5 May, the plume was dispersed mainly to the E over the continental area, and then to SE over the ocean (Fig. 3c). The values of the BTD image between -0.5 K and -0.2 K over northern Patagonia, however, are not captured by the model, which does not predict mass in this region. This difference may be explained by local remobilization of ash by wind, or inadequate model diffusion.

On 6 May the plume was initially dispersed to SE, but at around 06:00 UTC, it shifted to the NE and persisted on that trajectory until early on 8 May. The burst of eruption that occurred on 6 May at around 12:00 UTC, resulted in the maximum model column mass that moved during the following hours. The comparison of the BTD image at 19:15 UTC on 6 May with the model column mass shows a good correspondence (Fig. 3d) despite the fact that the location of the maximum mass in the simulations is shifted west with respect to the maximum BTD ash signal, which is located over the Valdes Peninsula of Argentina (Fig. 1, 3d). South of 43°S the ash cloud was not properly modeled.

On 7 May the plume detected over the northern part of Patagonia compares well with the modeled plume over that region. However, differences exist over Buenos Aires and La Pampa region (Fig. 1), with the BTD image showing a weak signal of ash E of Buenos Aires even though ash was visible in the MODIS true color image (not shown). In this case, the weakness of the BTD signal may be explained by the thinness of the plume and small size of the airborne particles.

4.2 Comparison with the Fallout Deposit

During the first week of the eruption (2-9 May) multiple lobes of fallout deposit were formed from differing plume trajectories. Figure 5 shows the daily depositional lobes predicted by the model. On 2 May the fallout deposit covered an area whose width encompassed an angle of approximately 45° but because wind intensity was low, the resulting lobe did not reach great distances. On 3 May, stronger winds produced a narrower and more elongated SE

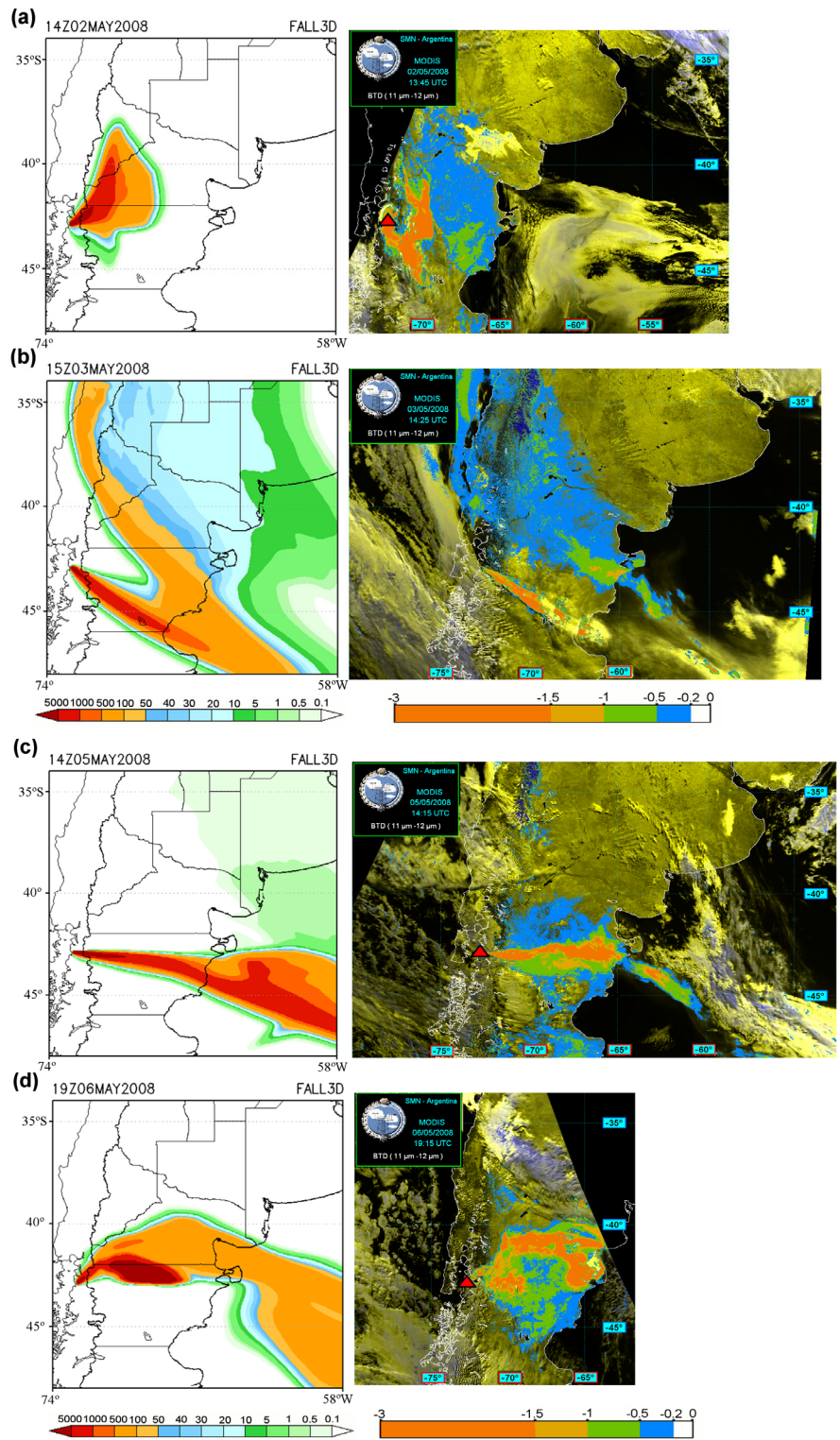


FIG. 3. Comparison between FALL3D column mass (in t/km^2) (left) and Brightness Temperature Difference (BTD) (in K) (right). The red triangle indicates the location of the Chaitén Volcano. Results for **a**: 2 May, 14:00 UTC; **b**: 3 May, 15:00 UTC; **c**: 5 May, 14:00 UTC; and **d**: 6 May, 19:00 UTC.

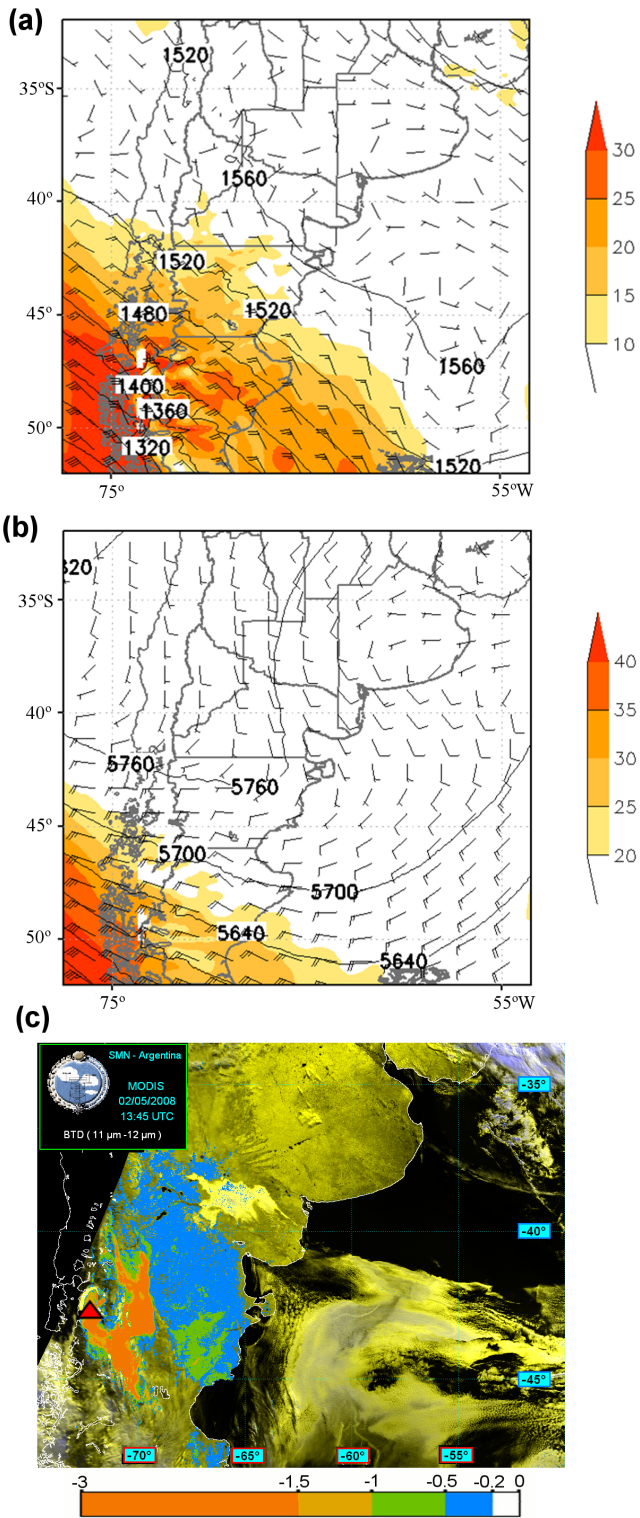


FIG. 4. WRF-ARW model meteorological fields for 2 May 15:00 UTC showing geopotential height (contour, m), wind barbs (5 m/s interval) and intensity (shaded, m/s) at (a) 850 hPa and (b) 500 hPa. During the 2 May 2008 eruption (c) the ash plume splits owing to the different vertical wind fields. The red triangle indicates the location of the volcano.

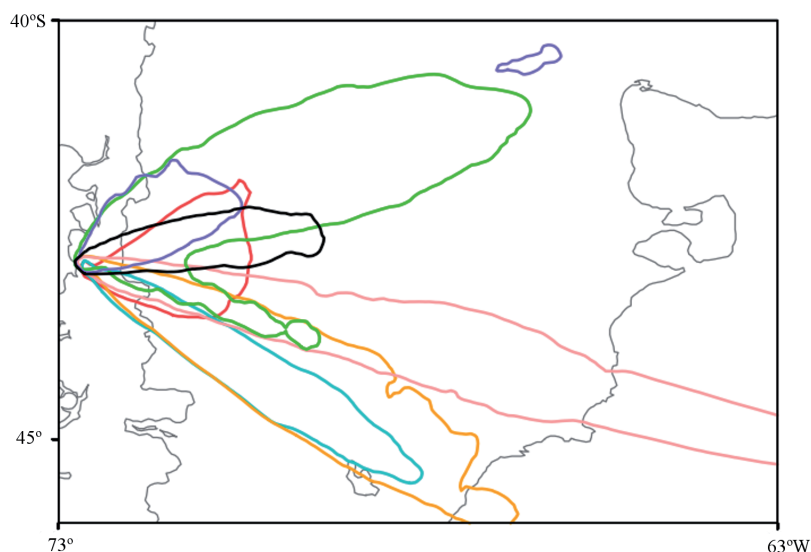


FIG. 5. Modelled deposit thickness (0.1 cm contours) for different days of May 2008: 2 (red), 3 (light blue), 4 (orange), 5 (light magenta), 6 (green), 7 (light purple) and 8 (black).

directed lobe that almost reached the Atlantic Coast. On 4 May, a similarly SE directed wind combined with an increase of the column height (Table 2) produced a larger lobe that reached the Gulf of San Jorge in the Atlantic Ocean (Fig. 1). From 5-8 May the anticyclonic wind rotation caused deposition of ash along two major lobes: one directed ESE and the other NE. As a result of the overlap of tephra fallout from different eruptive pulses and wind directions, we identified three main depositional axes directed NE, ESE, and SE respectively. Simulated deposit thicknesses for 2-9 May compare favorably with the isopach map of Watt *et al.* (2009) based on measurements of fall deposit taken approximately one month after the beginning of the eruption (Fig. 6).

The differences between simulated and actual deposition are particularly evident at the tip of the ESE deposit lobe. These differences can be explained by insufficient wind resolution in that particular location, the occurrence of local ash remobilization, and/or insufficient sampling. On the other hand, substantial differences occur also in the proximal-medial distances (less than about 100 km from the volcano), where the model largely underestimates deposit thickness with respect to observations. Model underestimation of thickness at distances closer to the volcano could be expected given the use of a fine-skewed TGSD (particles larger than 0.5 mm are not considered in our hindcast simulations). Also because the model does not include aggregation, the mass of fine ash deposited close to the volcano can be greatly underestimated. However,

as expected, the hindcast results present a much better fit to field data than those presented in Folch *et al.* (2008) (Fig. 6c). The better fit of our results owes to improved constraints on input parameters, namely the time-dependent eruption column height and MER, and two distinct field-based TGSDs. In addition, our hindcast simulation involved a re-initialization of the FALL3D model every 48 hours using actualized meteorological forecast cycles.

4.3 Comparison with Visibility Observations at Meteorological Stations

During the Chaitén eruption, some of the meteorological stations of the surface synoptic observation (SYNOP) network of the Argentinean National Meteorological Service (SMN) registered episodes of visibility reduction due to airborne ash. Visibility reduction is the result of the scattering and absorption of light by particles and gases in the atmosphere. The volcanic ash particles as well as sulfates, nitrates, organic carbon, and soil dust among others can significantly affect visibility.

Here we compare daily observations of visibility reduction at the surface with the ash concentration that is explicitly predicted by the model at the first vertical level (100 m above terrain). This comparison allows us to discern if visibility reduction by the presence of airborne ash correlates with the ash concentration thresholds for flight safety established in Europe during the 2010 Eyjafjallajökull eruption

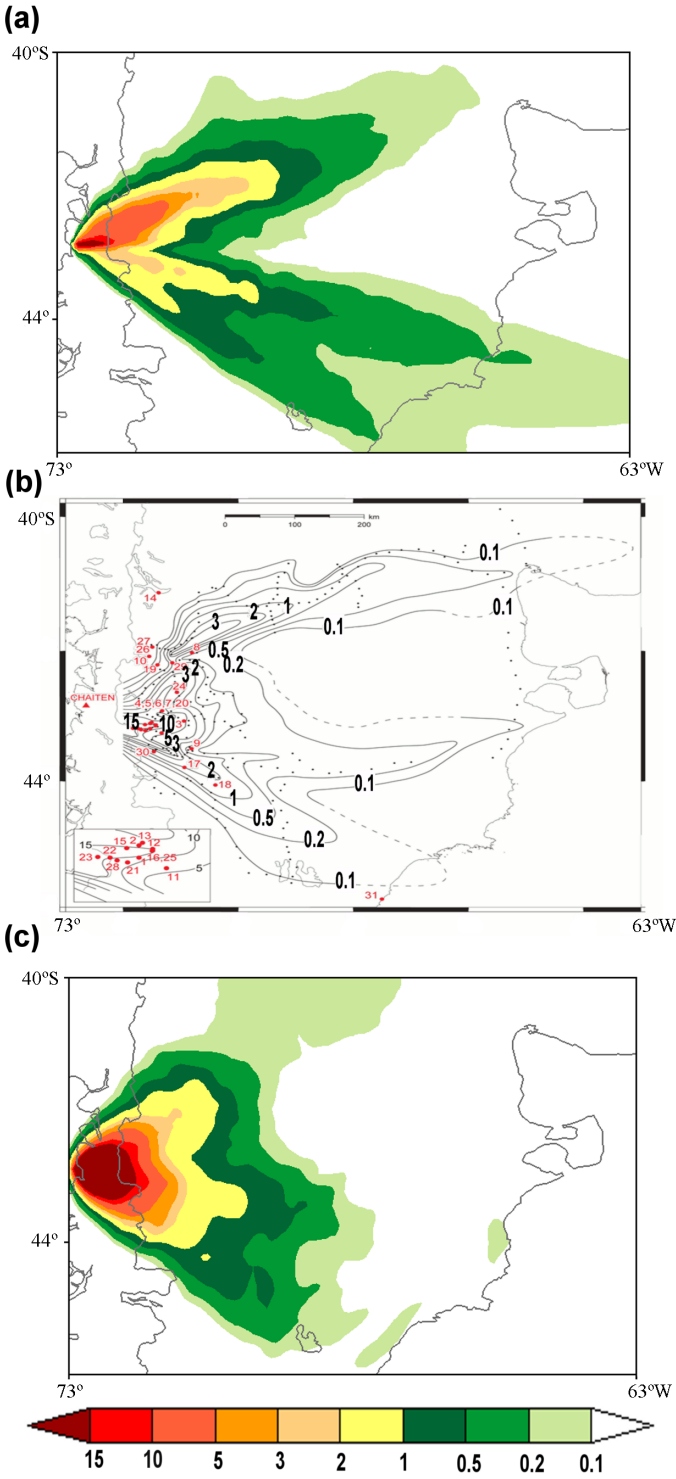


FIG. 6. **a:** Isopachs (*in cm*) at the end of the hindcast simulation (9 May 2008); **b:** Isopach map after Watt *et al.* (2009) (adapted from Durant *et al.*, 2012). Dots indicate sampling locations by Watt *et al.* (2009) (black) and Durant *et al.* (2012) (red). Dashed contours are contours inferred by Watt *et al.* (2009); **c:** Isopach at the end of the forecast simulation (9 May 2008) provided by Folch *et al.* (2008).

in Iceland, *i.e.*, more than 2 mg/m^3 for the no-fly zone (IVATF/2-DP/02, 2011; SN-2011/004, 2011). Figure 7 shows modeled near-ground ash concentrations overlapped with the meteorological stations that registered a reduction of visibility caused by the presence of ash at the same time.

On 5 May at 21:00 UTC the contour for near-surface ash concentration of 2 mg/m^3 traverses the continental area in an easterly direction (Fig. 7a). At that time, only one of the four stations that registered

reduced visibility lay within the high concentration zone and two lie only slightly north of it (small errors in forecasted winds and model diffusion can explain the lack of overlap). The fourth station, located on the Gulf of San Jorge coast, probably registered residual ash from the passage of a plume hours before.

On 6 May at 18:00 UTC, following the eruptive pulse at 12:00 UTC, six surface stations registered reduced visibility (Fig. 7b). Four of these are within

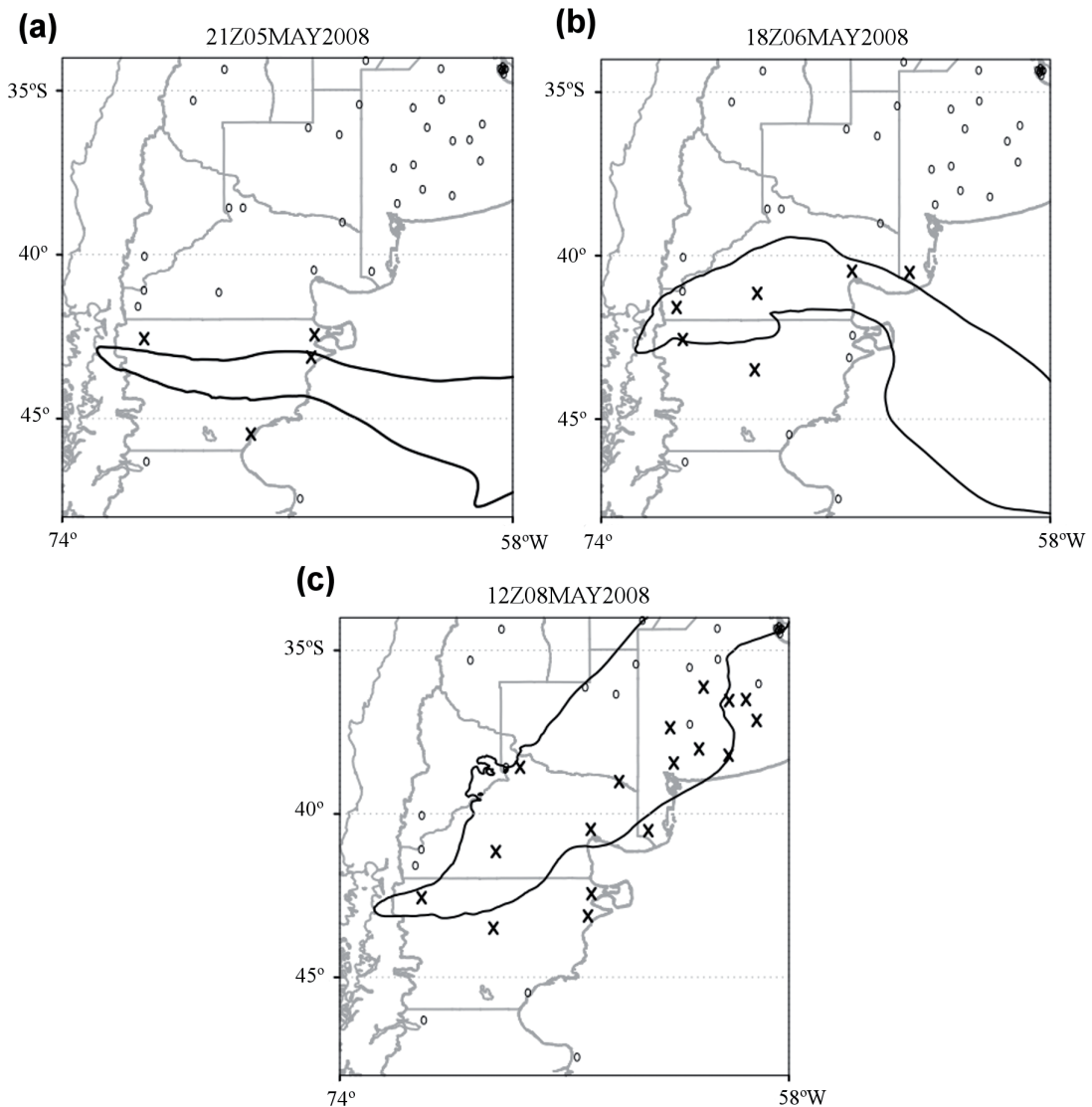


FIG. 7. Comparison between simulated near-ground ash concentration (2 mg/m^3 contour) and surface meteorological stations that registered (X) or did not register (O) reduced visibility by ash. Results for (a) 5 May at 21:00 UTC, (b) 6 May at 18:00 UTC, and (c) 8 May at 12:00 UTC.

the zone of predicted high concentration. At 12:00 UTC on 8 May (Fig. 7c), the plume was directed NE and many of the SYNOP network stations registered the presence of airborne ash, even as far away as in Buenos Aires (~1,500 km from the volcano).

In general, the modeled near-ground concentration contour of 2 mg/m³ agrees with the records of reduced surface visibility, although some stations that registered the presence of ash lay out of the critical area. This comparison suggests that the visual detection of ash could be related to the critical concentration threshold of 2 mg/m³, but in some cases the source could be local resuspension of ash. Further research on this subject is necessary in order to determine whether visual observations can be used effectively for aviation safety purposes at airports.

5. Summary and Conclusions

We simulated dispersion and deposition of the Chaitén ash plume during 2-9 May 2008 explosive phase of eruption using the Weather Research and Forecasting-Advanced Research Weather (WRF/ARW) - FALL3D modeling system. The strategy adopted here considered the initialization of the FALL3D model every 48 hours using the previously predicted airborne ash concentration and deposit thickness, combined with updated WRF/ARW 72 hours forecasts as the meteorological driver.

Qualitative comparisons with MODIS imagery allowed us to assess the degree of concordance between the simulated plume locations and the MODIS images processed with the brightness temperature difference (BTD) algorithm. Differences between simulations and observations may result from inadequate treatment of diffusion, the coarse horizontal and vertical model resolution (from 0.5 to 1 km in the vertical), inaccurate Total Grain Size Distribution (TGSD) or the resuspension of fine ash.

Comparison of model deposit thicknesses with an isopach map extracted from Watt *et al.* (2009) shows a good general agreement. Some features of the fallout deposits were not reproduced by the simulations. For example the tips of the deposit lobes and the secondary deposit maxima attributed to aggregation processes were not reproduced. Nevertheless, results substantially improve upon the forecast of Folch *et al.* (2008), in which a syn-eruptive forecast was performed using a seven day

WRF-ARW forecast (the FALL3D model was not reinitialized with actualized meteorological fields) and large uncertainties arising from volcanological inputs produced larger errors. Improvements in the results arise from better constraints on eruption column heights determined from GOES-10 IR images (available every ~15 minutes for the period of study) and nearby atmospheric soundings. Field-based distal TGSDs obtained during the first days of the eruption by Durant *et al.* (2012) helped constrain patterns of the distal deposits. However proximal deposits were underestimated because of the fine skewed TGSDs used here.

Qualitative comparison of visibility reduction at ground stations with modeled near-ground ash concentration (using a concentration threshold equal to the 2 mg/m³ no-fly threshold defined in Europe in 2010) show that surface visibility reduction might be related to forecasted concentrations above 2 mg/m³. However it is necessary to discriminate the origin of the suspended near-ground volcanic ash and further studies are necessary to determine the utility of this approach for the prediction of visibility reduction.

This work shows the usefulness of the combined WRF/ARW-FALL3D modelling system for short-term forecasting and hindcasting of volcanic ash clouds. However, it also highlights the necessity of obtaining reliable quasi real-time measurements of column heights and accurate granulometries, which in South America at least can only be the result of enhanced transnational collaboration.

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